## Relationship between Allergic Contact Dermatitis and Electrophilicity

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To evaluate the role of electrophilicity in the induction of allergic contact dermatitis (ACD) in humans, we compared the structure–activity relationship (SAR) model of ACD with those of electrophilic and nonelectrophilic subsets of chemicals in the ACD database. For these analyses, electrophilicity was defined as the potential of a chemical to induce mutations in *Salmonella*. It was found that electrophilicity accounted for approximately 30–40% of ACD-inducing ability, and the remainder was associated with nonelectrophilic structures. The identification of these moieties opens the possibility for studying their role in ACD. *Key words*: allergic contact dermatitis, electrophilicity, mutagenicity, SAR, structure–activity relationship. *Environ Health Perspect* 107:129–132 (1999). [Online 13 January 1999]

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One of the mechanistic paradigms associated with the disorder allergic cutaneous dermatitis (ACD) is that the agent (i.e., electrophile or proelectrophile) responsible for eliciting this response attacks a nucleophilic cellular target (1). Others suggest that it is the overall reactivity that determines the response (2). Electrophilicity is also associated with mutagenicity and carcinogenicity (3,4). Mutagenic (genotoxic) carcinogens are considered to pose a greater risk to humans than nongenotoxic ones (5). The relationship between ACD and other health risks has recently been addressed by Albert (6), who suggested a relationship between ACD and nongenotoxic carcinogens. The present study was undertaken to evaluate this hypothesis, to determine the extent to which electrophilicity contributes to ACD, and possibly to identify other, nonelectrophilic, mechanisms that also contribute to ACD. Our approach was based on our earlier observation that the structural basis of ACD in humans could be modeled successfully by an expert structure-activity relationship (SAR) system (7-9) yielding a predictivity of 84%. The approach we have taken here was to derive SAR submodels for electrophilic and nonelectrophilic chemicals in the ACD database and to compare features of the two submodels.

## **Methods**

CASE/MULTICASE. The algorithms employed within CASE and MULTICASE (Multicase, Inc., Beachwood, OH) have been described previously (10–12). Briefly, a set of chemicals and their respective experimentally determined biological activities (quantitative or qualitative) were input into a database. Both programs provide a means to identify descriptors consisting of molecular fragments, ranging from 2 to 10 heavy atoms along with their associated

hydrogens, which account for the biological activity of the compounds under study. The molecular fragments are generated as a result of breaking down each individual chemical structure within the database into its constituent parts. Each fragment is "labeled" with respect to its origin within active or inactive structures. Fragments of relevance are those that exhibit a statistically significant nonrandom distribution among the active and inactive classes of compounds. In addition to using molecular fragments, MULTICASE identifies relevant two-dimensional distances between atoms within a chemical structure.

At this point within the analysis, CASE uses the statistically significant fragments in order to classify compounds as active or inactive. Predictions for submitted compounds are expressed as percent probabilities (0–100%) of being active or inactive. In addition, CASE utilizes the molecular fragments of the total database to derive a "global" quantitative structure–activity relationship (QSAR), which is used to predict the potency or extent of activity. These two predictions are derived independently of one another.

MULTICASE, on the other hand, uses the set of statistically significant descriptors (fragment and/or distance) to find a descriptor (biophore) that has the highest probability of being responsible for the observed biological activity. Compounds within the database that contain the primary biophore are removed from the analysis, and subsequent biophores that explain the activity of the remaining compounds are selected. This iterative process of selection is continued until either all of the active compounds are accounted for or no statistically significant descriptors remain. The presence of biophores determines the likelihood of a compound to

exhibit activity. Predictions made on compounds submitted for SAR analysis consist of the identification of the biophore(s) responsible for activity and the percent probability of the compound being biologically active due to such occurrences. A compound is presumed to be inactive if it contains no biophores.

In MULTICASE, attempts are also made to derive a "local" QSAR within each group of compounds containing a particular biophore in order to identify molecular features that control the degree of activity. These features, termed modulators, are selected from the pool of molecular fragments, distance descriptors, calculated electronic indices (molecular orbital energies, charge densities), and calculated transport parameters (octanol/water partition coefficient, water solubility). These local QSARs are used to predict the potency of chemicals containing the specific biophore.

The similarity between structural determinants (i.e., biophores) associated with specific SAR models is taken to be a measure of mechanistic similarity (13–15). For this purpose, the biophores identified by the CASE program were used. The biophores selected were either identical (e.g., CH<sub>2</sub>-CH<sub>2</sub>- vs. CH<sub>2</sub>-CH<sub>2</sub>-) or embedded (e.g., CH<sub>2</sub>-CH<sub>2</sub>-vs. CH<sub>2</sub>-CH<sub>2</sub>-CH<sub>2</sub>-). The structural overlap was defined as number of overlapping fragments/total number of significant fragments.

The database of mutagenicity in Salmonella was developed under the aegis of the National Toxicology Program (NTP) (16–21). An SAR model based upon subsets of that database has been described (22).

**Database.** The database used for SAR modeling was described previously (7,8). With respect to the present analyses in the model of ACD in humans, an "active" chemical elicits a response in human patch testing or has a sensitization rate of at least 16% in human maximization tests, when given at a dose greater than 10%. A chemical with "marginal" activity has a sensitization

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rate of 4–15% under the same conditions. An "inactive" chemical is one that has a sensitization rate of <4% in human maximization testing.

## **Results and Discussion**

To classify the chemicals in the ACD database into electrophiles/proelectrophiles and nonelectrophiles, we chose their potential

Table 1. Origin and composition of the three structure-activity relationship models

Characterization	ACD (n)	ACD-NE (n)	ACD-EL (n)
Total database	767	652	179
ACD+	355	266	88
ACD <sub>m</sub>	29	26	3
ACD <sup>""</sup>	383	366	88
Potential nonelectrophiles	652	652	52
Potential nonelectrophiles ACD+	266	266	0
Potential nonelectrophiles ACD	366	366	52
Potential electrophiles	114	0	127
Potential electrophiles ACD	88	0	36
Potential electrophiles ACD+	23	0	88

Abbreviations: ACD, allergic contact dermatitis; NE, nonelectrophiles; EL, elecrophiles.

ACD<sup>+</sup>, ACD<sub>m</sub>, and ACD<sup>-</sup> refer to chemicals shown experimentally to induce, marginally induce, and not induce allergic contact dermatitis, respectively. Potential electrophiles and potential nonelectrophiles refer to chemicals predicted to be mutagens and nonmutagens, respectively.

to induce mutations in Salmonella as a surrogate for electrophilicity. This is based upon the recognition 1) that mutagenicity in Salmonella derives from an electrophilic attack and 2) that the Salmonella mutagenicity protocol includes testing in the presence of an exogenous metabolic activation mixture, thereby making it possible to identify proelectrophiles. Accordingly, we used an SAR model of the induction of mutations in Salmonella to classify chemicals with known ACD-inducing activity as potential electrophiles and nonelectrophiles. The predictivity of the model for Salmonella mutagenicity assay is 81%; however, because its sensitivity and specificity are approximately the same, the chance of false positive and false negative predictions is equal.

ragmen										Fragments					•	
	2	3	4	5	6	7	8	9	10	Sub	(n)	Inactives	Marginals	Actives	<i>p</i> -Value	No
	-CH <sub>2</sub> -										50	1	0	49	0.000	1
	−CH <sub>3</sub>										26	1	0	25	0.000	2
	=C-										35	2	0	33	0.000	3
1	-C-										5	0	0	5	0.031	4
H	-CH-										10	0	0	10	0.001	5
l	-CH <sub>2</sub> -										26	1	1	24	0.000	6
l	−CH <sub>3</sub>										5	0	0	5	0.031	7
l,	-CH <sub>2</sub> -										7	0	0	7	0.008	8
رَا	-NH -										5	. 0	0	5	0.031	9
oxide	-CH <sub>2</sub> -										5	0	0	5	0.031	10
	−C =										89	10	0	79	0.000	11
	-C -									•	6	0	0	6	0.016	13
	-C -										5	0	0	5	0.031	13
	-C =										14	0	0	14	0.000	14
	-CH <sub>2</sub> -										19	0	1	18	0.000	1
	-CH <sub>2</sub> -										8	0	0	8	0.004	10
	−N −										5	0	0	5	0.031	1
	-S -										5	0	0	5	0.031	1
а	-C0	-CH =									15	0	0	15	0.000	19
	-C	=CH									19	0	0	19	0.000	2
l	-C	=CH -									19	0	1	18	0.000	2
	-C	-C -									10	1	0	9	0.006	2:
	=C-	CH =								<2-NO <sub>2</sub> > <sup>b</sup>	5	0	0	5	0.031	2
2	-CH	-CH <sub>2</sub> -							<	2-Epoxide>	5	0	0	5	0.031	2
2	=C	-CH-								<2-C0>	10	0	5	5	0.031	2
	=CH	-CH	=C -								141	36	3	102	0.000	2
	=N	–CH	=CH -								8	0	0	8	0.004	27
2	<b>–С</b>	=CH	−C =								5	0	0	5	0.031	28
2	-C	=CH	-CH =								27	4	0	23	0.000	29
	-C0	-C	=CH <sub>2</sub> -								21	1	5	15	0.000	3
	- <u>С</u>	=CH	-C =								13	0	0	13	0.000	3
	=C	-CH	=C-	_						<2-0>	5	0	0	5	0.031	3
	=C	-C	=C	C =							5	0	0	5	0.031	3
	=C	-C		-CH =							25	1	0	24	0.000	3
2	=CH	-CH	=CH	-Cc=							36	10	0	26	0.004	3
3	-С	=CH		=CH -							11	1	0	10	0.003	30
	-CH <sub>2</sub>	-С		-CH =							5	0	0	5	0.031	3
	=CH <sup>*</sup>	-CH		-CH =						<4-CO>	18	4	0	14	0.010	38
l <sub>2</sub>	-CH <sub>2</sub>	-CH <sub>2</sub>	-C	-CH <sub>2</sub> -	_					<4-CH <sub>3</sub> >	5	0	Ō	5	0.031	39
l <sub>2</sub>	-CH <sub>2</sub>	-CH2	-CH2	−CH̄₂	-C=						15	0	0	15	0.000	4

<sup>&</sup>lt; > indicates a substitutent. In biophore 36, the second and fourth carbon from the left are shown unsubstituted; this means they must be substituted by an atom other than hydrogen. On the other hand, in biophore 38, the unsubstituted fourth carbon from the left can only be substituted by a CO moiety, whereas the second carbon from the left in biophore 38 is shown with a hydrogen attached. No other atom can be at that location.

<sup>&</sup>quot;This moiety is attached by a double bond to an outside substituent

<sup>&</sup>lt;sup>b</sup>A nitro substituent is on the second carbon atom from the left.

<sup>&</sup>lt;sup>c</sup>This carbon atom is common to two rings.

0

0

0

O

16

31

14

11

0.000

0.000

0.000

0.000

15

16

17

18

Overall, it should be noted that while 28.0% of the 384 ACD-inducing agents were predicted to be mutagens, only 6% of the 383 noninducing chemicals were predicted to be mutagens. This suggests that electrophilicity is associated with ACD ( $p \le 0.0001$ ;  $\chi^2$  test), but that it is only one of a number of factors because it cannot explain the basis of the allergenicity of the remaining 72% of ACD-inducing agents.

The ACD data available consisted of 917 chemicals tested in humans; however, only 767 of these were used to construct the SAR model. Recent studies have shown that a ratio of active to inactive molecules in the learning set of unity was optimal for

developing SAR models (15). Because inactive chemicals exceeded active ones, we randomly deleted some of them (using a computerized random number generator). Our final model consisted of 355 chemicals that were active in the human patch test or in the human maximization test, 29 marginally active and 383 inactive chemicals (8). As a result, we had a surplus of ACD noninducing chemicals that were not used to construct the ACD SAR model. A total of 652 of the 767 chemicals in the ACD database (85.0%) were predicted to be Salmonella nonmutagens (nonelectrophiles). Of these, 266 (40.8%) were inducers of ACD, 26 were marginal inducers, and 366

(56.1%) were noninducers of ACD (database: ACD-NE) (Table 1).

One hundred fourteen of the chemicals in the ACD database (14.9%) were predicted to be Salmonella mutagens (electrophiles). Of these, 88 (77.2%) were ACD inducers, 3 were marginal inducers, and 23 (20.2%) were noninducers. To increase the number of potential electrophilic ACD noninducers in the SAR model, we screened the "excess" ACD noninducers (n = 150) that had not been used to construct the original ACD SAR model. An additional 13 potential electrophilic non-ACD inducers were thus identified. To bring the ratio of ACD-active to ACD-inactive to

Fragment Fragments																
	2	3	4	5	6	7	8	9	10	Sub	(n)	Inactives	Marginals	Actives	<i>p</i> -Value	No.
	-C =										10	0	0	10	0.001	1
	-CH <sub>2</sub>										13	1 .	0	12	0.001 ·	2
	-CH <sub>3</sub> -										7	0	0	7	0.008	3
Н	=C -										12	1	0	11	0.002	4
4	–C =										5	1	0	14	0.000	5
1	-CH <sub>2</sub> -										10	0	0	10	0.001	6
2	-C =										20	1	0	19	0.000	7
oxide	-CH <sub>2</sub>										5	0	0	5	0.031	8
	-C =										9	0	0	9	0.002	9
	-CH <sub>2</sub> -										7	0	0	7	0.008	10
1	-N -										5	0	0	5	0.031	11
	=C	C =								<2-0H>*	7	1	0	6	0.035	12
	=C	-CH =								<2-NO <sub>2</sub> >	5	0 `	0	5	0.031	13
2	-CH	-CH <sub>2</sub> -							<	2-Epoxide>	5	0	0	5	0.031	14

17

37

15

11

1

1

=CH

=CH

=C

C

CH

NO

=C -

=C -

–CH ≈

agm	ent									Fragments						
	2	3	4	5	6	7	8	9	10	Sub	(n)	Inactives	Marginals	Actives	<i>p</i> -Value	No.
	-CH <sub>2</sub> -										37	0	0	37	0.000	1
	−CH <sub>3</sub>										19	1	0	18	0.000	2
	=C -										23	1	0	22	0.000	3
1	C =										14	0	1	13	0.000	4
l	–CH –										6	0	0	6	0.016	5
	-CH <sub>2</sub> -										16	1	1	14	0.000	6
2	-CH <sub>2</sub> -									•	5	0	0	5	0.031	7
	-C =										81	10	0	71	0.000	8
	-C =										5	0	0	5	0.031	9
	-CH <sub>2</sub> -										16	0	1	15	0.000	10
	-NHT-										17	0	1	16	0.000	11
		=CH -									10	0	0	10	0.001	12
	-C	=CH -									24	1	0	23	0.000	13
	-C	-C -									6	0	0	6	0.016	14
	–CH	=CH <sub>2</sub> -									9	0	0	9	0.002	15
	=C	-CH =								<2-NH <sub>2</sub> >*	6	0	0	6	0.016	16
	=C	–C	=C							-	21	0	0	21	0.000	17
	=N		=CH –								8	0	0	8	0.004	18
	-C0		=CH <sub>2</sub>								19	1	5	13	0.000	19
	-CH <sub>2</sub>	–C	=CĤ	–CH =							5	0	0	5	0.031	20
	=CH	-CH	=C	–C =						<4-CH <sub>2</sub> >	8	0	0	8	0.004	21

<sup>&</sup>lt; > indicates a substituent.

<sup>&</sup>lt; > indicates a substituent.

A hydroxyl group is on the second carbon from the left.

<sup>\*</sup>An amino group is on the second carbon from the left.

**Table 5.** Summary of structural overlaps among allergic contact dermatitis (ACD) models

SAR model	Compared to	Overlap
ACD (total)	ACD	100%
	ACD-EL	42%
	ACD-NE	73%
ACD-NE	ACD-NE	100%
(nonelectrophiles)	ACD	95%
·	ACD-EL	45%
ACD-EL	ACD-EL	100%
(electrophiles)	ACD	100%
•	ACD-NE	63%

SAR, structure—activity relationship. Structural overlaps were determined as described in "Methods"; they are based upon the biophores of Tables 2, 3, and 4 as well as expanded fragments derived from them.

unity, we included an additional 52 ACD noninducers randomly selected from the data set (Table 1). The inclusion of potentially nonelectrophilic non-ACD inducers should not affect the SAR analyses to be performed, as we were interested only in activating moieties (biophores). Thus, this database (ACD-EL) consisted of 88 ACD inducers, 3 marginal inducers, and 88 noninducers (Table 1). Using CASE/MULTI-CASE we developed SAR models for the ACD, ACD-EL, and ACD-NE databases.

The major biophores associated with the "parent" ACD SAR model (Table 2) are, as expected, also present in the putative electrophilic (ACD-EL, Table 3) and nonelectrophilic (ACD-NE, Table 4) SAR submodels. Indeed, this is further evidenced by the extent of the structural overlap (i.e., commonality of fragments) between ACD on one hand and ACD-EL (42%) and ACD-NE (73%) on the other (e.g., Fragment 5 in Table 3 is identical to Fragment 4 in Table 4, etc.) (Table 5). This clearly suggests that the induction of ACD is not solely due to electrophilicity. However, as expected, the ACD-EL SAR model clearly contains typically electrophilic biophores (Table 3, biophores 7, 8, 18; e.g., arylamines, epoxides, and ortho-substituted nitroarenes) that are absent from the ACD-NE SAR model (Table 4). Further indication that ACD-EL and ACD-NE models reflect common, nonelectrophilic mechanisms of ACD induction is the substantial structural overlap between ACD-NE and ACD-EL, 45-63% (Table 5). Moreover, the ACD-NE model is highly predictive of the chemicals in ACD-EL and vice versa (i.e., 85 and 78% respectively, Table 6).

The findings described in this paper indicate that while electrophilicity is associated with the potential for inducing ACD, it is

Table 6. Cross-predictivities of the two structure-activity relationship (SAR) submodels

SAR model	Chemicals being predicted <sup>a</sup>	Concordance	<i>p</i> -Value*	
ACD-NE (n = 652)	ACD-EL (electrophiles) (n = 179)	85.0%	<0.00001	
ACD-EL (n = 179)	ACD-NE (nonelectrophiles) ( $n = 652$ )	78.1%	< 0.00001	

ACD, allergic contact dermatitis.

probably only one of the mechanisms involved. Clearly, the nonelectrophilic biophores identified in the two SAR submodels provide clues of alternate mechanisms whereby ACD may be induced. They need to be investigated further with respect to their origin and possible mechanistic significance.

Based on an examination of the activity of chemicals in the NTP rodent carcinogenicity bioassay and as ACD-inducing agents, Albert (6) suggested that there was a component among nongenotoxic carcinogens that was shared by human ACDinducing agents. He reasoned that the results of ACD testing and mutagenicity testing in Salmonella could be complementary and could be used to identify carcinogens. Our results indicate that ACD is driven, to a large part, by nonelectrophilic mechanisms. Our findings, however, do not address the question of whether activity as an ACD-inducing agent can complement mutagenicity in Salmonella in predicting potential carcinogens.

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The ACD-NE SAR model was used to predict the ACD-inducing ability of the chemicals used to derive the ACD-EL model and vice versa.
\*Statistical significance of the concordance between experimental and predicted results.